Supporting Appendix

Cooperative Behavior Cascades in Human Social Networks

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In Tables S1a-S1d, we show regression results used to estimate the total effects shown in Fig. 3 of the main text.

In Tables S1a and S2a-S2d, we show regression results used to estimate the effects shown in the top two panels of Fig. 4 of the main text.

In Tables S1b and S3a-S3c, we show regression results used to estimate the effects shown in the bottom two panels of Fig. 4 of the main text.

In Tables S4a-b we show regression results used to estimate the mediation effect of alter's contribution on the relationship between alter's alter's contribution and ego's contribution. What this mediation analysis shows is that, as we theorized, the total effect of alter's alter on ego disappears when we control for the effect of alter on ego. This is a classic mediation result. Suppose that X affects M and M affects Y, then X can affect Y via its influence on M. In this case X is the alter's alter, M is the alter, and Y is the ego. To test whether or not a mediation effect is present requires two regressions, (1) regress M on X (first model in Tables S4a and S4b), and (2) regress Y on Y on Y and Y is a mediator if the product of the coefficients on Y in the first regression and Y in the second regression is significant (p<0.001 in both the public goods game and the public goods game with

punishment). Furthermore, we note that the effect of alter's alter is no longer significant in the second regression, suggesting that *X* has no independent influence on *Y*. In other words, alter's alter's effect on ego results from alter's alter's effect on alter and then alter's effect on ego.

In Tables S5a-b we show regression results used to estimate the effect of alter's alter's and alter's alter's alter's punishment behavior on ego's contribution.

In Tables S6a and S6b, we demonstrate that egos are not more influenced by "selfish" behavior than by "generous" behavior. In other words, alter's effect on ego does not vary for high and low contributions (increasing alter's contribution from 0MUs and 10MUs has the same effect on ego as increasing from 10MUs to 20MUs). In Table S6a, we use the *median contribution of the group* as a point of reference to divide high and low contributions, and in Table S6b we use the *ego's own contribution* as a point of reference.

In Table S7a and S7b, we explore the possibility that groups rather than specific individuals influence ego's behavior. In Table S7a, we show that alter significantly influences ego even when we include the contributions made by the other two members of the group as a control. In Table S7b, we test the influence of the other two member's contributions on alter's effect on ego by adding an interaction term to the model. The effect is significant in the public goods game but not in the public goods game with punishment, and in both cases the effect size is negligible. When other members of the group increase their contributions, it decreases the influence of alter on ego by 0.004. If we hold other group members' contributions constant at 10 each, the model suggests that an additional MU contributed by alter increases the contribution of ego in the next period by 0.160MUs, but if we increase other group members' contributions by 1MU, then an additional MU contributed by alter increases the contribution of ego in the next

period by 0.156MUs. And even when others contribute maximally, alter's effect on ego remains significant (p=0.04).

In Table S8, we show that punishment behavior does not spread from alters to ego.

In Tables S9a-S9c, we study the effect of groups of alters rather than individual alters. These models show that the sum total of contributions by all alters in the group significantly influence ego's contribution up to two degrees of separation in the normal public goods game and up to three degrees of separation in the public goods game with punishment, mirroring the individual-level results in Tables S1a-S1c. We present these results to show that the effects are robust to specification. However, it is important to remember that the estimates in the Table S9 regressions will be downwardly biased because they do not account for censoring of individual decisions (47). For example, a group of alters that contributes 15+15+15=45 will have the same value as a group that contributes 20+20+5=45, but in the latter group the two individuals who gave 20 may have wanted to give more and could not because of the interval constraints of the experiment (20 was the maximum permitted contribution). In the group-based models, an observation is only counted as censored if all three alters contribute the maximum (60) so information about censoring at the individual level is lost.

In Tables S10a and S10b, we add additional lags to the model of alter's influence on ego and alter's alter's influence on ego. Note that the model results reported in Table S10 indicate that alter and alter's alter significantly influence ego in both the public goods game and the public goods game with punishment, and the effect sizes are nearly identical. However, the cost of these models is dramatically reduced sample size (an therefore the efficiency of estimation) since each additional lag eliminates one period of observations.

Finally, in Table S11, we add 235 fixed effects for each unique subject (except the baseline subject, since a constant is in the model). This method has the advantage of controlling for all fixed differences between individuals and/or sessions, but it is well known to generate coefficients that are biased towards zero, especially when the number of fixed effects is large, as it is here. In spite of the conservative nature of this technique, we find that alter continues to have large and significant effects on ego as in the models without fixed effects.

Table S1a: Effect of Alter's Contribution on Ego's Contribution

Dependent Variable: Ego's Contribution in Period t **Public Goods Game Public Goods Game** with Punishment S.E. Coef. Coef. S.E. р р *Alter's Contrib. Period t* − 1 0.19 0.03 0.00 0.18 0.02 0.00 Ego's Contribution Period t – 1 0.98 0.03 0.00 0.82 0.02 0.00 Period 3 0.54 0.04 -0.20 0.30 0.50 -1.11 Period 4 -1.11 0.52 0.03 -0.62 0.28 0.03 Period 5 -1.24 0.54 0.02 0.30 0.60 -0.16 Period 6 -2.64 0.60 0.00 -0.91 0.37 0.01 0.00 0.00 -3.89 0.51 2.26 0.38 Constant Log Likelihood -7721 -8190 Null Log Likelihood -8499 -9035 Ν 3480 3480

Table S1b: Effect of Alter's Alter's Contribution on Ego's Contribution

	<u>Dependent Variable:</u> <u>Ego's Contribution in Period t</u>									
	Public	Goods	Game		s Game nment					
	Coef.	S.E.	p	Coef.	S.E.	р				
Alter's Alter's Contribution Period t – 2	0.07	0.02	0.00	0.05	0.01	0.00				
Ego's Contribution Period t – 2	0.90	0.04	0.00	0.70	0.03	0.00				
Period 4	-0.69	-0.69 0.60 0.25		-0.56	0.33	0.09				
Period 5	-0.77	0.63	0.23	-0.33	0.34	0.34				
Period 6	-1.60	0.68	0.02	-0.68	0.40	0.09				
Constant	-4.57	0.60	0.00	6.49	0.43	0.00				
Log Likelihood		-18346			-19870)				
Null Log Likelihood		-19553		-21156						
N		8316		8316						

Table S1c: Effect of Alter's Alter's Alter's Contribution on Ego's Contribution

			-	t Variabl			
		<u>Ego's</u>	Contribu	<u>ition in P</u> Public	<u>eriod t</u> : Goods	Gamo	
	Public	Goods	Game	with Punishment			
	Coef.	S.E.	р	Coef.	S.E.	р	
Alter's Alter's Alter's Contrib. Period t – 3	0.03	0.02	0.17	0.06	0.02	0.00	
Ego's Contribution Period t – 3	0.77	0.03	0.00	0.65	0.02	0.00	
Period 5	-0.53	0.35	0.14	0.06	0.20	0.77	
Period 6	-1.65	0.40	0.00	-0.63	0.23	0.01	
Constant	-4.85	0.47	0.00	7.74	0.39	0.00	
Log Likelihood		-13767			-15086		
Null Log Likelihood		-14353		-15796			
N		6355		6355			

Table S1d: Effect of Alter's Alter's Alter's Alter's Contribution on Ego's Contribution

	<u>Dependent Variable:</u> <u>Ego's Contribution in Period t</u>								
	-	Ego's C olic Goo Game		Public Goods Gam with Punishment					
	Coef.	S.E.	р	Coef.	S.E.	р			
Alter's Alter's Alter's Contrib. Period t – 4	0.00	0.07	0.98	-0.02	0.04	0.60			
Ego's Contribution Period t – 4	0.79	0.08	0.00	0.51	0.05	0.00			
Period 6	1.39	1.18	0.24	-1.33	0.48	0.01			
Constant	-8.08	1.50	0.00	12.02	1.01	0.00			
Log Likelihood		-2097			-2559				
Null Log Likelihood		-2161			-2636				
N		1026			1080				

Table S2a: Effect of Alter's Contribution on Ego's Contribution Two Periods Later

	<u>Dependent Variable:</u> <u>Ego's Contribution in Period t</u>									
	Public	Goods	Game		Game ment					
	Coef.	S.E.	p	Coef.	S.E.	p				
Alter's Contrib. Period t – 2	0.15	0.03	0.00	0.15	0.02	0.00				
Ego's Contribution Period t – 2	0.90	0.04	0.00	0.70	0.03	0.00				
Period 4	-0.58	0.60	0.33	-0.69	0.33	0.04				
Period 5	-0.58	0.64	0.37	-0.55	0.34	0.11				
Period 6	-1.29	0.69	0.06	-0.96	0.40	0.02				
Constant	-5.38	0.66	0.00	5.31	0.48	0.00				
Log Likelihood		-6106			-6605					
Null Log Likelihood		-6518		-7052						
N		2772			2772					

Table S2b: Effect of Alter's Contribution on Ego's Contribution Three Periods Later

				ent Variab			
		<u>Ego's</u>	S Contrib	oution in l Publ	<u>Period t</u> ic Goods	Game	
	Public	Goods	Game	with Punishment			
	Coef.	S.E.	p	Coef.	S.E.	p	
Alter's Contrib. Period t – 3	0.08	0.04	0.04	0.11	0.03	0.00	
Ego's Contribution Period t – 3	0.78	0.04	0.00	0.63	0.03	0.00	
Period 5	-0.64	-0.64 0.65 0.33			0.35	0.86	
Period 6	-1.34	0.71	0.06	-0.73	0.41	0.07	
Constant	-5.35	0.74	0.00	7.13	0.63	0.00	
Log Likelihood		-4499			-4926		
Null Log Likelihood		-4699		-5169			
N		2064			2064		

Table S2c: Effect of Alter's Contribution on Ego's Contribution Four Periods Later

		1	Depende	ent Variab	ole:		
		Ego's	s Contrib	oution in			
	Dublic	Goods	Cama	Public Goods Game			
	Public	Goods	Game	with Punishment			
	Coef.	S.E.	p	Coef.	S.E.	p	
Alter's Contrib. Period t – 4	0.17	0.05	0.00	0.14	0.04	0.00	
Ego's Contribution Period t – 4	0.77	0.06	0.00	0.63	0.04	0.00	
Period 6	-1.34	0.78	0.09	-1.03	0.42	0.02	
Constant	-8.09	1.02	0.00	7.79	0.73	0.00	
Log Likelihood		-2825			-3166		
Null Log Likelihood		-2928			-3317		
N		1356			1356		

Table S2d: Effect of Alter's Contribution on Ego's Contribution Five Periods Later

		<u> </u>	<u>Depende</u>	ent Variat	ole:		
		Ego's	S Contrib	oution in	Period t		
				Publ	ic Goods	Game	
	Public	Goods	Game	with Punishment			
	Coef.	S.E.	p	Coef.	S.E.	p	
Alter's Contrib. Period t – 5	0.17	0.09	0.05	0.14	0.06	0.02	
Ego's Contribution Period t – 5	0.65	0.09	0.00	0.58	0.07	0.00	
Constant	-9.52	1.51	0.00	9.13	1.16	0.00	
Log Likelihood		-1287			-1500		
Null Log Likelihood		-1316		-1544			
N		648		648			

Table S3a: Effect of Alter's Alter's Contribution on Ego's Contribution Three Periods Later

			-	nt Variab ution in			
	Public	Goods	Game		Game ment		
	Coef.	S.E.	p	Coef.	S.E.	p	
Alter's Alter's Contribution Period t – 3	0.03	0.02	0.25	0.04	0.02	0.01	
Ego's Contribution Period t – 3	0.78	0.04	0.00	0.64	0.03	0.00	
Period 5	-0.70	0.65	0.29	0.01	0.35	0.98	
Period 6	-1.46	0.70	0.04	-0.59	0.41	0.15	
Constant	-4.81	0.66	0.00	7.92	0.54	0.00	
Log Likelihood		-13501			-14798		
Null Log Likelihood		-14098		-15508			
N		6192		6192			

Table S3b: Effect of Alter's Alter's Contribution on Ego's Contribution Four Periods Later

		<u> </u>	Depende	ent Variab	ole:		
		<u>Ego's</u>	Contrib	oution in	Period t		
					ic Goods		
	Public	Goods	Game	with Punishment			
	Coef.	S.E.	p	Coef.	S.E.	p	
Alter's Alter's Contribution Period t – 4	0.07	0.03	0.02	0.02	0.02	0.36	
Ego's Contribution Period t – 4	0.76	0.06	0.00	0.63	0.04	0.00	
Period 6	-1.44	0.78	0.06	-0.82	0.43	0.05	
Constant	-6.98	0.90	0.00	9.32	0.66	0.00	
Log Likelihood		-8489			-9521		
Null Log Likelihood		-8785		-9951			
N		4068			4068		

Table S3c: Effect of Alter's Alter's Contribution on Ego's Contribution Five Periods Later

	<u>Dependent Variable:</u> <u>Ego's Contribution in Period t</u>									
	Public	Goods	Game		Game nent					
	Coef.	S.E.	p	Coef.	S.E.	p				
Alter's Alter's Contribution Period t – 5	0.01	0.05	0.77	-0.01	0.04	0.85				
Ego's Contribution Period t – 5	0.65	0.09	0.00	0.58	0.07	0.00				
Constant	-8.02	1.31	0.00	10.98	1.05	0.00				
Log Likelihood		-3867			-4508					
Null Log Likelihood		-3948			-4630					
N		1944		1944						

Table S4a: Mediation Analysis, Public Goods Game

	Dependent Variable:									
		Ego's		4	Alter's			Ego's		
	Coi	Contribution			Contribution			Contribution		
	in Period t			in F	Period	t-1	in Period t			
	Coef.	S.E.	р	Coef.	S.E.	p	Coef.	S.E.	p	
Alter's Alter's Contrib. Period t – 2	0.07	0.02	0.00	0.28	0.03	0.00	0.03	0.02	0.15	
Alter's Contribution Period t – 1							0.24	0.03	0.00	
Ego's Contribution Period t – 2	0.90	0.04	0.00	0.03	0.02	0.11	0.90	0.04	0.00	
Period 4	-0.69	0.60	0.25	-2.17	0.67	0.00	-0.38	0.59	0.52	
Period 5	-0.77	0.63	0.23	-3.42	0.67	0.00	-0.29	0.63	0.64	
Period 6	-1.60	0.68	0.02	-4.49	0.72	0.00	-1.03	0.68	0.13	
Constant	-4.57	0.60	0.00	4.51	0.62	0.00	-6.27	0.64	0.00	
Log Likelihood	-18346			-20756			-	-18257		
Null Log Likelihood	-19553		-20970			-19553				
N		8316			8316		8316			

Interval regression models of ego and alter contributions, controlling for multiple observations of the same ego and multiple observations of the same alter using Huber-White sandwich standard errors. The results in the first model show that the size of the total effect of alter's alter on ego is 0.07 (95% C.I. 0.03 to 0.10). We can use the results of the second and third model to calculate the size of the indirect effect of alter's alter on ego that is mediated by alter, which is 0.07 (95% C.I. 0.05 to 0.09). We note that, as theorized, the effect of alter's alter is no longer significant when we control for alter. These results together mean we cannot reject the hypothesis that the total effect of alter's alter on ego is mediated by the effect of alter's alter on alter.

Table S4b: Mediation Analysis, Public Goods Game with Punishment

	Dependent Variable:										
		Ego's			Alter's			Ego's			
	Col	Contribution			Contribution			Contribution			
	in Period t			in P	eriod t	– 1	in Period t				
	Coef.	S.E.	р	Coef.	S.E.	p	Coef.	S.E.	р		
Alter's Alter's Contrib. Period t – 2	0.05	0.01	0.00	0.19	0.03	0.00	0.03	0.02	0.15		
Alter's Contribution Period t – 1							0.17	0.02	0.00		
Ego's Contribution Period t – 2	0.70	0.03	0.00	0.01	0.01	0.38	0.70	0.03	0.00		
Period 4	-0.56	0.33	0.09	0.91	0.38	0.02	-0.70	0.33	0.03		
Period 5	-0.33	0.34	0.34	1.20	0.38	0.00	-0.51	0.34	0.13		
Period 6	-0.68	0.40	0.09	2.46	0.41	0.00	-1.00	0.40	0.01		
Constant	6.49	0.43	0.00	12.17	0.44	0.00	4.40	0.50	0.00		
Log Likelihood	-19870			-	-21631			-19791			
Null Log Likelihood	-21156			-21811			-21156				
N		8316			8316		8316				

Interval regression models of ego and alter contributions, controlling for multiple observations of the same ego and multiple observations of the same alter using Huber-White sandwich standard errors. The results in the first model show that the size of the total effect of alter's alter on ego is 0.05 (95% C.I. 0.03 to 0.08). We can use the results of the second and third model to calculate the size of the indirect effect of alter's alter on ego that is mediated by alter, which is 0.03 (95% C.I. 0.02 to 0.05). We note that, as theorized, the effect of alter's alter is no longer significant when we control for alter. These results together mean we cannot reject the hypothesis that the total effect of alter's alter on ego is mediated by the effect of alter's alter on alter.

Table S5a: Effect of Alter's Received Punishment on Ego's Contribution Two Rounds Later

	Dependent Variable:					
	<u>Ego's Co</u>	ntribution in	Period t			
	Coef.	S.E.	p			
Punishment Rec'd by Alter in Period t – 2	0.13	0.05	0.02			
Alter's Contribution in Period t – 2	0.18	0.03	0.00			
Punishment Rec'd by Ego in Period t – 2	0.45	0.07	0.00			
Ego's Contribution in Period t – 2	0.86	0.03	0.00			
Period 4	-1.14	0.33	0.00			
Period 5	-0.98	0.34	0.00			
Period 6	-1.45	0.40	0.00			
Constant	1.82	0.62	0.00			
Log Likelihood		-6565				
Null Log Likelihood		-7052				
N		2772				

Interval regression models of effect of alter's received punishment on ego's contribution, controlling for ego's prior received punishment and ego's and alter's prior contribution, period fixed effects, and multiple observations of the same ego and multiple observations of the same alter using Huber-White sandwich standard errors.

Table S5b: Effect of Alter's Alter's Received Punishment on Ego's Contribution Three Rounds Later

	<u>Dep</u>	endent Varia	able:
	Ego's Co	ntribution in	n Period t
	Coef.	S.E.	p
Punishment Rec'd by Alter's Alter in Period t – 3	0.09	0.07	0.25
Alter's Alter's Contribution in Period t – 3	0.02	0.04	0.64
Punishment Rec'd by Ego in Period t – 3	0.30	0.08	0.00
Ego's Contribution in Period t – 3	0.75	0.05	0.00
Period 5	-0.08	0.41	0.84
Period 6	-0.74	0.45	0.10
Constant	6.04	0.90	0.00
Log Likelihood		-5004	
Null Log Likelihood		-5244	
N		2118	

Interval regression models of effect of alter's alter's received punishment on ego's contribution, controlling for ego's prior received punishment and ego's and alter's alter's prior contribution, period fixed effects, and multiple observations of the same ego and multiple observations of the same alter's alter using Huber-White sandwich standard errors.

Table S6a: Effect of Alter's Contribution on Ego's Contribution is Similar Regardless of Whether Alter's Contribution is High or Low

	<u>Dependent Variable:</u> <u>Ego's Contribution in Period t</u>							
					c Goods	Game		
	Public	Goods Game with Pun			n Punishr	nent		
	Coef.	S.E.	p	Coef.	S.E.	р		
Alter's Contrib. Period t – 1 X								
Alter's Contrib. Period t − 1 > Median	-0.23	0.14	0.10	0.02	0.10	0.87		
Alter's Contrib. Period t – 1 > Median	3.23	0.88	0.00	-0.28	1.86	0.88		
Alter's Contrib. Period t – 1	0.23	0.13	0.07	0.17	0.03	0.00		
Ego's Contribution Period t – 1	0.98	0.03	0.00	0.82	0.02	0.00		
Period 3	-1.09	0.54	0.04	-0.20	0.30	0.51		
Period 4	-1.06	0.52	0.04	-0.62	0.28	0.03		
Period 5	-1.18	0.54	0.03	-0.15	0.30	0.62		
Period 6	-2.53	0.60	0.00	-0.91	0.37	0.01		
Constant	-4.28	0.55	0.00	2.28	0.42	0.00		
Log Likelihood		-7714			-8190			
Null Log Likelihood		-8499			-9035			
N		3480			3480			

Interval regression models of effect of alter's contribution on ego's contribution, controlling for ego's prior contribution, period fixed effects, and multiple observations of the same ego and multiple observations of the same alter using Huber-White sandwich standard errors. Interaction term shows the differential effect of being a higher-than-median (within the group) contributor. The interaction term is not significant, suggesting the ego does not pay more attention to higher-than-median contributors.

Table S6b: Effect of Alter's Contribution on Ego's Contribution is Similar Regardless of Whether Alter's Contribution is Above or Below Ego's Contribution

			-	nt Variab ution in		
		<u> </u>	COMMIN		c Goods	Game
	Public	Goods	Game	with	Punish	ment
	Coef.	S.E.	p	Coef.	S.E.	p
Alter's Contrib. Period t – 1 X						
Ego's Contrib. > Alter's Contrib. Period t – 1	-0.11	0.07	0.11	-0.02	0.05	0.70
Ego's Contrib. > Alter's Contrib. Period t – 1	1.83	0.69	0.00	0.51	0.77	0.51
Alter's Contrib. Period t – 1	0.26	0.04	0.00	0.20	0.04	0.00
Ego's Contribution Period t – 1	0.93	0.04	0.00	0.80	0.03	0.00
Period 3	-1.10	0.54	0.04	-0.21	0.30	0.49
Period 4	-1.13	0.52	0.03	-0.62	0.28	0.03
Period 5	-1.28	0.54	0.02	-0.16	0.30	0.60
Period 6	-2.64	0.60	0.00	-0.91	0.37	0.01
Constant	-4.67	0.60	0.00	1.93	0.61	0.00
Log Likelihood		-7717			-8190	
Null Log Likelihood		-8499			-9035	
N		3480			3480	

Interval regression models of effect of alter's contribution on ego's contribution, controlling for ego's prior contribution, period fixed effects, and multiple observations of the same ego and multiple observations of the same alter using Huber-White sandwich standard errors. Interaction term shows the differential effect of being a higher-than-median (within the group) contributor. The interaction term is not significant, suggesting the ego does not pay more attention to alters who contribute more than they did.

Table S7a: Effect of Alter's Contribution on Ego's Contribution, Controlling for Others' Contributions

	<u>Dependent Variable:</u>							
		<u>Ego</u>	's Conti		in Period t	="		
	Dublio	Goods	Como		olic Goods			
	Public	Goods	Game	W	ith Punish	ment		
	Coef.	S.E.	р	Coef.	S.E.	p		
Alter's Contrib. Period t – 1	0.17	0.03	0.00	0.17	0.02	0.00		
Ego's Contribution Period t – 1	0.95	0.03	0.00	0.81	0.02	0.00		
Other's Contribution Period t – 1	0.17	0.03	0.00	0.17	0.01	0.00		
Period 3	-0.77	0.53	0.15	-0.61	0.29	0.03		
Period 4	-0.34	0.51	0.51	-1.34	0.28	0.00		
Period 5	-0.22	0.54	0.56	-1.01	0.29	0.00		
Period 6	-1.47	0.61	0.59	-2.06	0.37	0.00		
Constant	-6.70	0.59	0.00	-1.90	0.44	0.00		
Log Likelihood		-7673			-8101			
Null Log Likelihood		-8499			-9035			
N		3480			3480			

Table S7b: Effect of Interaction Between Alter's Contribution and Others' Contributions on Ego's Contribution

	<u>Dependent Variable:</u> Ego's Contribution in Period t							
	Public (<u>Egos (</u> Goods (Public		ods Game		
	Coef.	S.E.	p	Coef.	S.E.	p		
Alter's Contrib. Period $t - 1 X$ Other's Contribution Period $t - 1$	-0.004	0.002	0.05	-0.001	0.002	0.49		
Alter's Contrib. Period t – 1	0.24	0.04	0.00	0.21	0.06	0.00		
Other's Contribution Period t – 1	0.20	0.02	0.00	0.19	0.03	0.00		
Ego's Contribution Period t – 1	0.95	0.03	0.00	0.81	0.02	0.00		
Period 3	-0.81	0.53	0.13	-0.63	0.29	0.03		
Period 4	-0.38	0.51	0.45	-1.34	0.28	0.00		
Period 5	-0.25	0.54	0.64	-1.01	0.29	0.00		
Period 6	-1.48	0.61	0.02	-2.05	0.37	0.00		
Constant	-7.20	0.62	0.00	-2.45	0.81	0.00		
Log Likelihood		-7671			-8101			
Null Log Likelihood		-8499			-9035			
N		3480 3480			3480			

Interval regression models of effect of an interaction between alter's contribution and others' contributions on ego's contribution, controlling for alter's contribution, others' contributions, ego's prior contribution, period fixed effects, and multiple observations of the same ego and multiple observations of the same alter using Huber-White sandwich standard errors.

Table S8: Effect of Alter's Punishment Behavior on Ego's Punishment Behavior

Dependent Variable:
Punishment in the
Public Goods Game
with Punishment

	Coef.	S.E.	p
Alters' Punishments Directed at Ego in Period t – 1	0.01	0.04	0.83
Ego's Punishments in Period t – 1	0.72	0.06	0.00
Period 3	0.84	0.36	0.02
Period 4	0.50	0.31	0.10
Period 5	0.21	0.33	0.54
Period 6	0.13	0.30	0.67
Constant	-0.92	0.31	0.00
Log Likelihood		-2150	
Null Log Likelihood		-2306	
N		1160	

Interval regression models of effect of alters' punishments of ego on ego's punishments of others in the next round, controlling for ego's prior punishment behavior, period fixed effects, and multiple observations of the same ego using Huber-White sandwich standard errors.

Table S9a: Effect of Alter Group's Contribution on Ego's Contribution

Dependent Variable: Ego's Contribution in Period t **Public Goods Game Public Goods Game** with Punishment Coef. S.E. Coef. S.E. р р Alter Group's Contrib. Period t – 1 0.09 0.01 0.00 0.12 0.01 0.00 Ego's Contribution Period t – 1 0.56 0.04 0.00 0.61 0.04 0.00 Period 3 0.57 0.43 -0.31 0.39 0.42 -0.45 Period 4 -0.40 0.52 0.36 -0.81 0.30 0.01 Period 5 -0.03 0.49 0.95 0.38 0.10 -0.64 Period 6 0.49 0.42 0.00 -0.69 0.16 -1.48 0.44 0.00 0.51 0.40 1.56 0.38 Constant Log Likelihood -3622 -3249 Null Log Likelihood -3927 -3583 Ν 1160 1160

Table S9b: Effect of Alter's Alter Group's Contribution on Ego's Contribution

	<u>Dependent Variable:</u> <u>Ego's Contribution in Period t</u>								
	Pub	lic Go		Public Goods Game					
	0(Game			ith Punis				
	Coef.		р	Coef.		p			
Alter's Alter Group's Contribution Period t – 2	0.07	0.03	0.01	0.09	0.03	0.00			
Ego's Contribution Period t – 2	0.48	0.04	0.00	0.49	0.05	0.00			
Period 4	-0.34	0.46	0.46	-0.55	0.31	0.07			
Period 5	0.05	0.61	0.93	-0.67	0.50	0.18			
Period 6	-0.21	0.61	0.73	-1.18	0.55	0.03			
Constant	0.48	0.84	0.57	5.28	1.11	0.00			
Log Likelihood	-2959			2959 -2682					
Null Log Likelihood	-3109			-3109 -2837					
N		924 924							

Table S9c: Effect of Alter's Alter's Alter Group's Contribution on Ego's Contribution

	<u>Dependent Variable:</u>						
	Ego's Contribution in Period t Public Goods Game						
	Public	Goods	Game	with	Punishr	nent	
	Coef.	S.E.	p	Coef.	S.E.	p	
Alter's Alter's Alter Group's Contribution							
Period t – 3	0.02	0.03	0.47	0.11	0.03	0.00	
Ego's Contribution Period t – 3	0.39	0.05	0.00	0.43	0.05	0.00	
Period 5	-0.06	0.45	0.90	-0.39	0.33	0.24	
Period 6	-0.39	0.57	0.50	-1.28	0.45	0.00	
Constant	1.61	0.97	0.10	5.75	1.26	0.00	
Log Likelihood		-2228			-2031		
Null Log Likelihood		-2299			-2116		
N		688			688		

Table S10a: Effect of Alter's Contribution on Ego's Contribution in a Model That Includes Additional Lags of Ego's Behavior

	Dependent Variable:						
	<u> </u>	Ego's (Contrib	oution in Period t			
	Pub	lic Go	ods	Public	Goods	Game	
		Game		with	Punish	ment	
	Coef.	S.E.	р	Coef.	S.E.	p	
Alter's Contrib. Period t – 1	0.23	0.05	0.00	0.16	0.04	0.00	
Ego's Contrib. Period t – 1	0.80	0.06	0.00	0.55	0.07	0.00	
Ego's Contrib. Period t – 2	0.32	0.07	0.00	0.21	0.07	0.00	
Ego's Contrib. Period t – 3	0.03	0.07	0.62	0.03	0.06	0.64	
Ego's Contrib. Period t – 4	0.18	0.06	0.00	0.27	0.06	0.00	
Period 6	-0.99	0.65	0.13	-1.10	0.37	0.00	
Constant	-9.17	0.80	0.00	-0.30	0.80	0.71	
Log Likelihood		-2621			-3027		
Null Log Likelihood		-2928			-3317		
N		1356			1356		

Table S10b: Effect of Alter's Alter's Contribution on Ego's Contribution in a Model That Includes Additional Lags of Ego's Behavior

	<u>Dependent Variable:</u>							
	<u> </u>	go's (ution in	ution in Period t				
	Pub	lic Go	ods	Public Goods Game				
		Game		with	Punish	ment		
	Coef.	S.E.	р	Coef.	S.E.	p		
Alter's Alter's Contrib. Period t – 1	0.07	0.03	0.03	0.06	0.02	0.00		
Ego's Contrib. Period t – 1	0.70	0.07	0.00	0.50	0.06	0.00		
Ego's Contrib. Period t – 2	0.22	0.07	0.00	0.15	0.06	0.02		
Ego's Contrib. Period t – 3	0.25	0.06	0.00	0.30	0.06	0.00		
Period 6	-0.65	0.72	0.36	-0.85	0.40	0.03		
Constant	-8.66	0.85	0.00	3.41	0.69	0.00		
Log Likelihood		-8187			-9280			
Null Log Likelihood		-8785			-9951			
N		4068			4068			

Table S11: Effect of Alter's Contribution on Ego's Contribution in a Model That Includes Ego Fixed Effects

	<u>Dependent Variable:</u>							
	<u>Ego's Contribution in Period t</u> Public Goods Public Goods G							
		Game		with	Punish	ment		
	Coef.	S.E.	p	Coef.	S.E.	р		
Alter's Contrib. Period t – 1	0.17	0.02	0.00	0.14	0.02	0.00		
Period 3	-2.41	0.42	0.00	1.16	0.24	0.00		
Period 4	-4.02	0.40	0.00	1.52	0.23	0.00		
Period 5	-5.41	0.43	0.00	2.40	0.25	0.00		
Period 6	-7.36	0.50	0.00	2.06	0.30	0.00		
Constant	0.05	1.58	0.00	13.21	0.38	0.00		
Log Likelihood		-6699			-7292			
Null Log Likelihood		-8499			-9035			
N		3480			3480			

Interval regression models of effect of alter's contribution on ego's contribution, controlling for ego's prior contribution, period fixed effects, ego fixed effects for 235 subjects, and multiple observations of the same ego and multiple observations of the same alter using Huber-White sandwich standard errors. Coefficients on fixed effects not shown.